# California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Modeling Analyses of Data Captured During the CRPAQS Field Program

Qi Ying<sup>1</sup>, James Chen<sup>2</sup>, Jianlin Hu<sup>3</sup>, Jin Lu<sup>4</sup>, and Michael Kleeman<sup>2</sup>

<sup>1</sup>Civil and Environmental Engineering, Texas A&M
<sup>2</sup>Civil and Environmental Engineering UC Davis

<sup>3</sup>Atmospheric Science, UC Davis

<sup>4</sup>Planning and Technical Support Division, CAPB

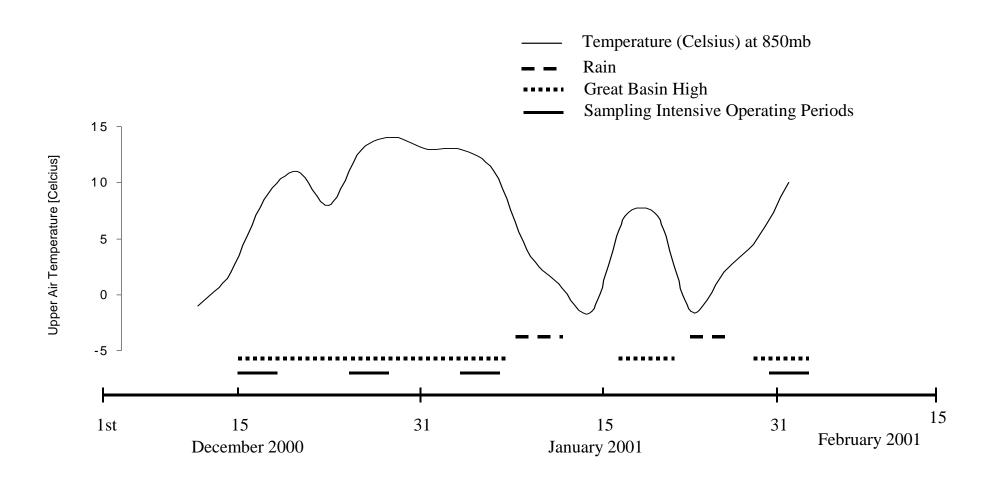
<sup>4</sup>Planning and Technical Support Division, CARB



# Acknowledgements

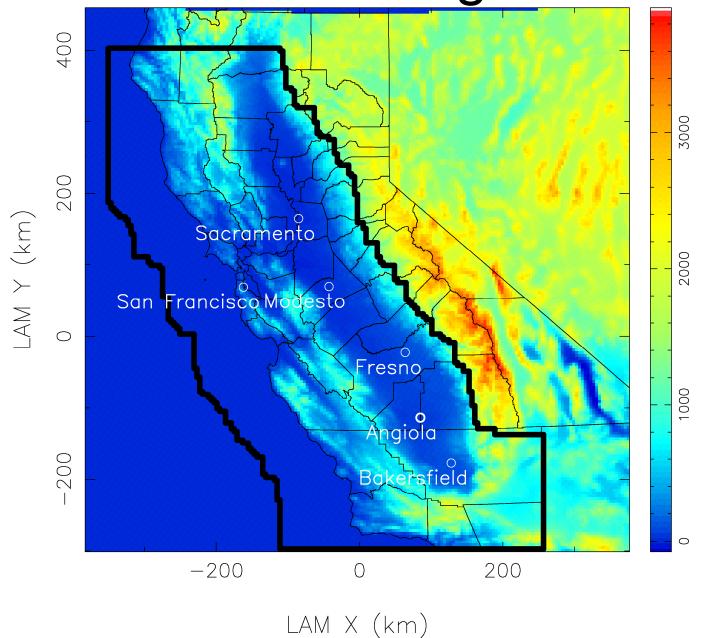
- Karen Magliano, Ajith Kaduwela, Vernon Hughes
- Paul Allen, Paul Livingstone
- Everyone who made measurements during CRPAQS
- Zhan Zhao, Shuhua Chen
- San Joaquin Valleywide Air Pollution Study Agency
- United States Environmental Protection Agency

# Meteorological Patterns During CRPAQS Winter Intensive



Source: J. Herner, J. Aw, O. Gao, D.P. Chang, and M.J. Kleeman, "Size and Composition Distribution of Airborne Particulate Matter in Northern California: 1 – Particulate Mass, Carbon, and Water-Soluble Ions", J. Air. Waste Manag. Assoc., 55: 30-51, 2005.

**CRPAQS Modeling Domain** 

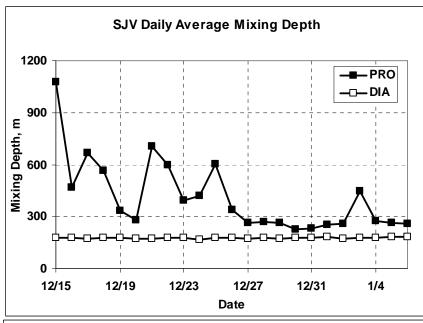


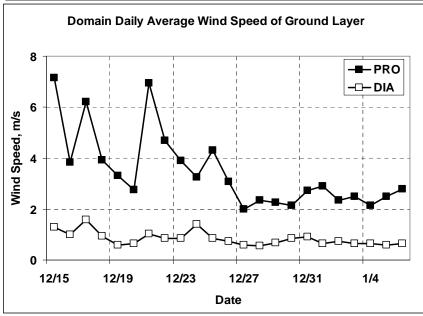
# Phase 1 Project Objectives

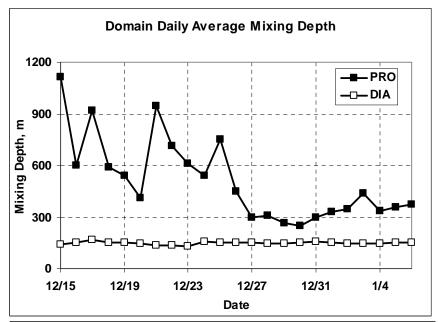
- 1. Create a speciated emissions inventory for air quality modeling (complete)
- 2. Generate diagnostic meteorology fields and compare to prognostic fields (complete)
- 3. Evaluate sub-grid emissions transformation processes (complete)
- 4. Generate diagnostic air quality fields for initial conditions and boundary conditions (complete)

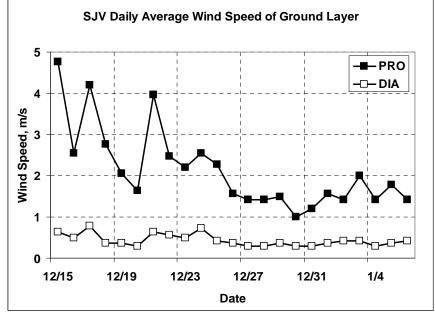
# Phase 1 Project Objectives

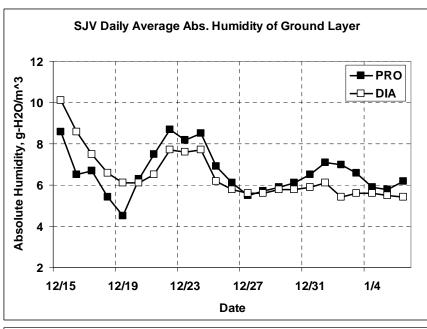
- 1. Modify UCD/CIT model to simulate larger CRPAQS domain and incorporate faster thermodynamic calculations (complete)
- 2. Perform calculations for CRPAQS IOPs 1-3 and validate basecase performance (complete)
- 3. Source Apportionment of Primary PM (complete)
- 4. Source Apportionment of Secondary PM (complete)
- 5. Regional Impacts on PM (complete)

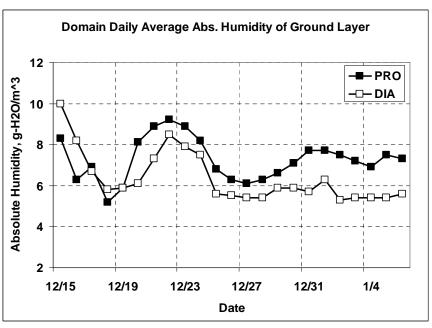


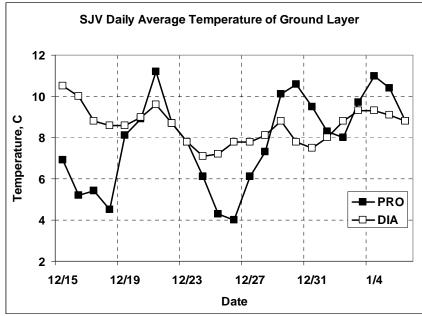


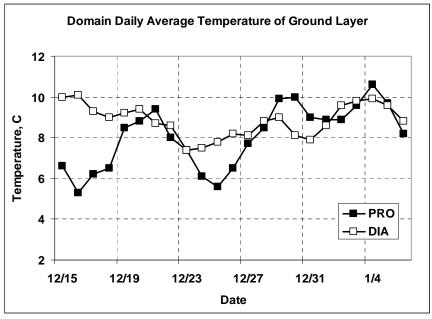


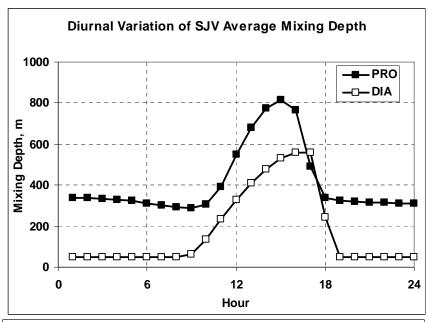


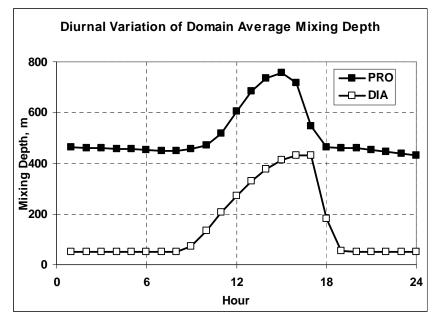


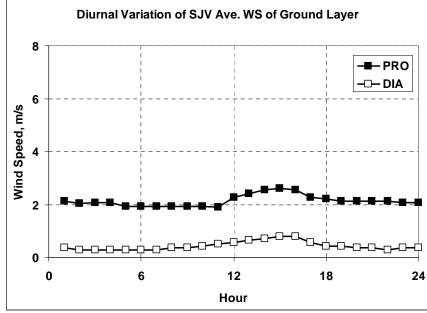


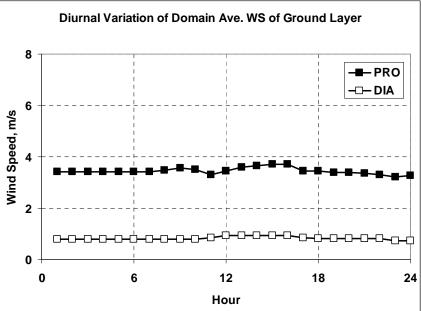


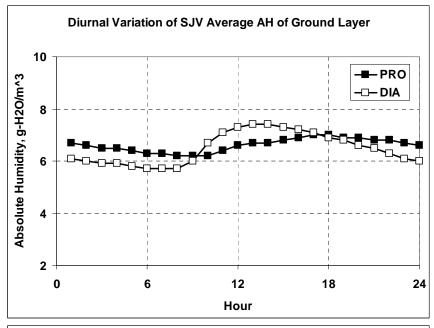


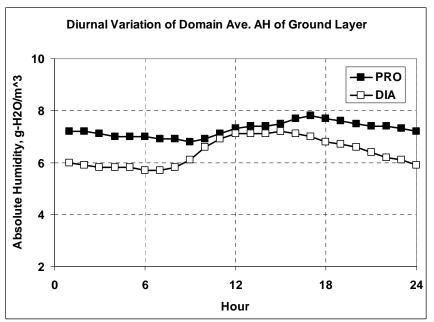


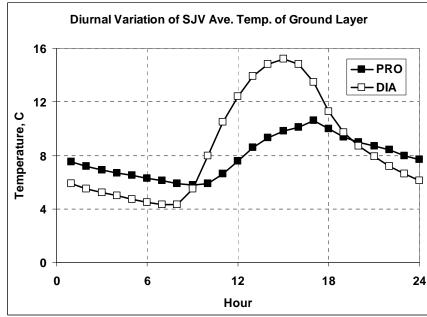


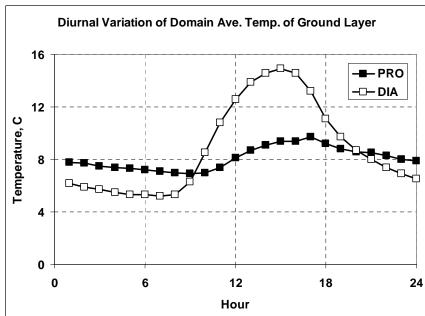




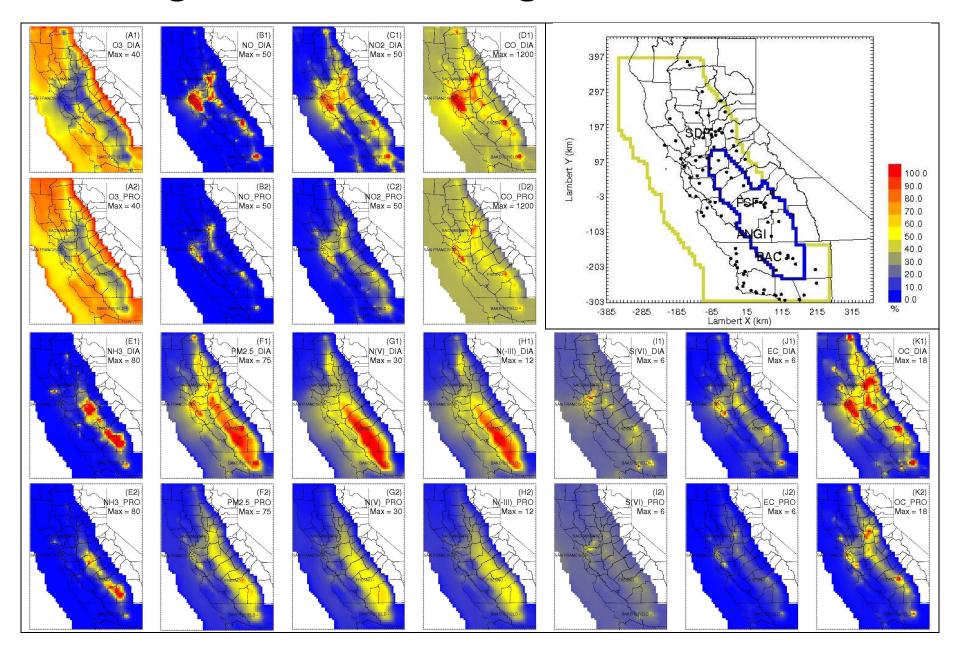








# Diagnostic vs. Prognostic Results



# Diagnostic vs. Prognostic Conclusions

- Similar results, but higher mixing depths and larger surface wind speeds dilute prognostic results
- Diagnostic results are slightly more accurate at the surface

#### CO

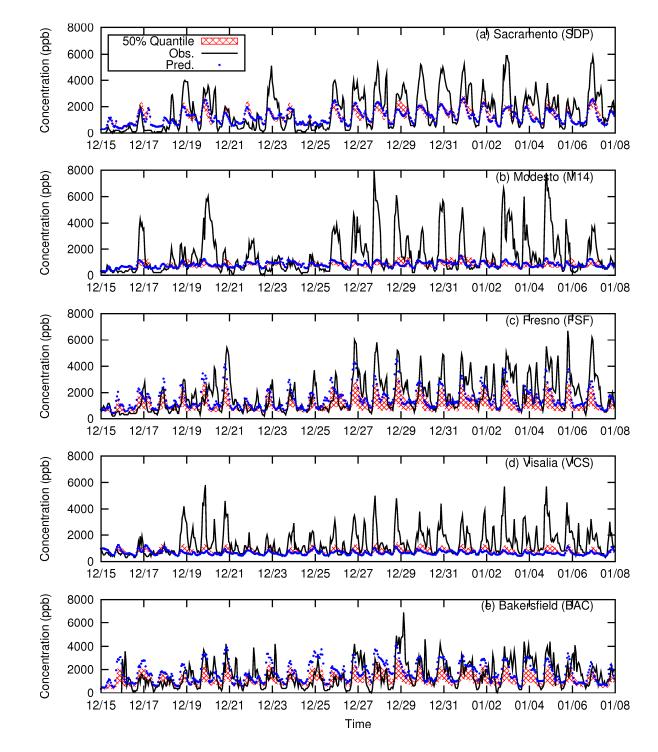
Black Line - measurements

Blue Line – predictions

Red Shading – Mid 50% Quantile within 10km of monitor

Sacramento, Fresno, Bakersfield have correct diurnal pattern

Modesto and Visalia do not reproduce observed diurnal pattern

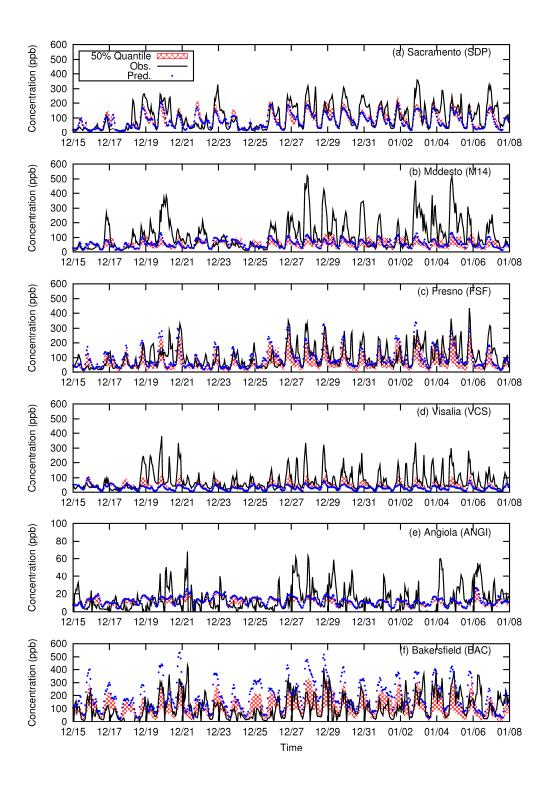


#### NOx

Good agreement at Sacramento and Fresno

Slight over-prediction at Bakersfield, but spatial gradients are sharp

Miss the diurnal trend at Modesto, Visalia, and Angiola (what sources drive the observed trends?)

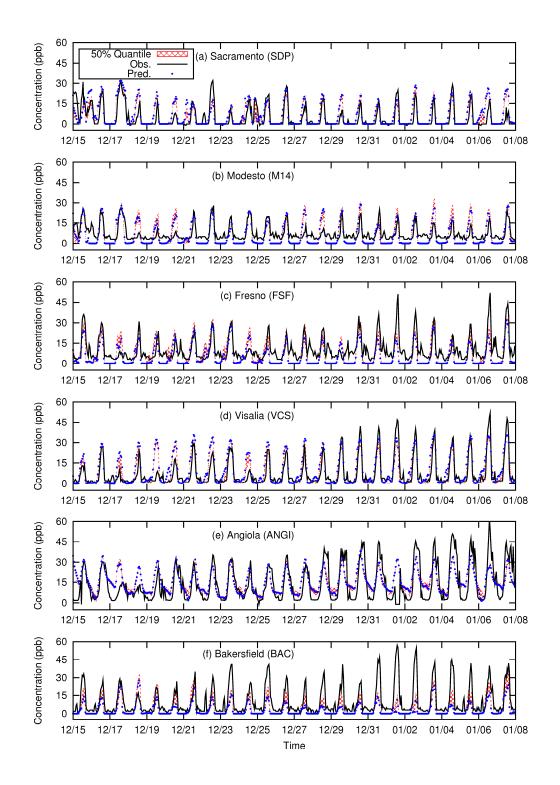


#### O3

#### Good agreement at most stations

Majority of the ozone is background that mixes down to the surface during the middle of the day

Background O3 is actually the dominant oxidant in the atmosphere

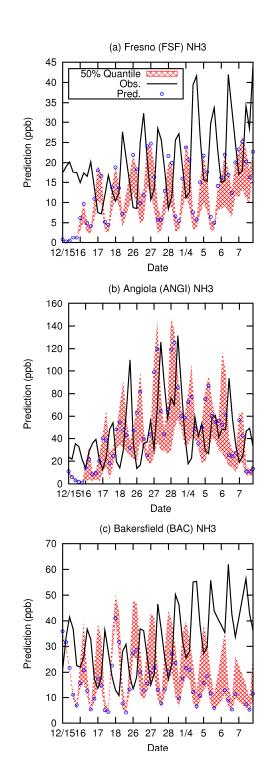


### NH3

Overall concentrations are order-ofmagnitude correct

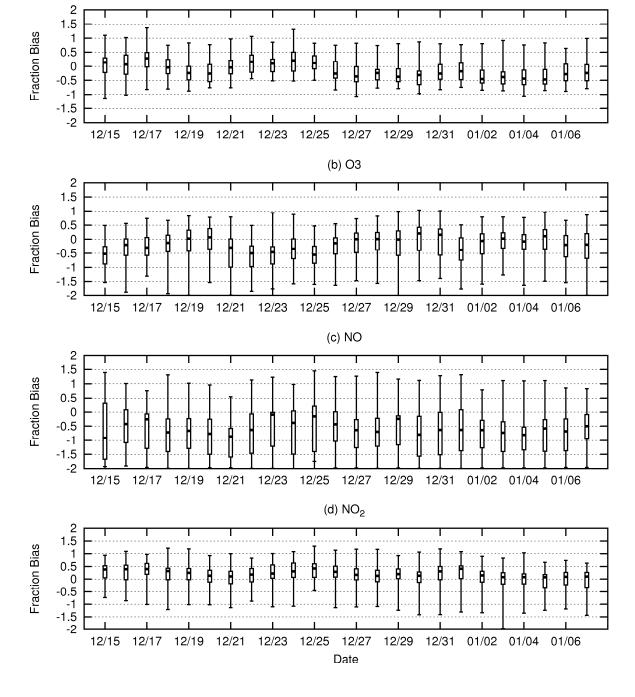
Diurnal cycle is exactly opposite measured values

Nitrate production is limited by production of nitric acid, so the details are not critical



# Fractional Bias at All Stations

$$FB = \frac{2}{N} \times \sum \frac{C_{p,i} - C_{o,i}}{C_{p,i} + C_{o,i}}$$



(a) CO

Source: Q. Ying, J. Lu, P. Allen, P. Livingstone, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part I. Base Case Model Results.", Atmos. Env., in press, 2008.

# PM2.5 Mass

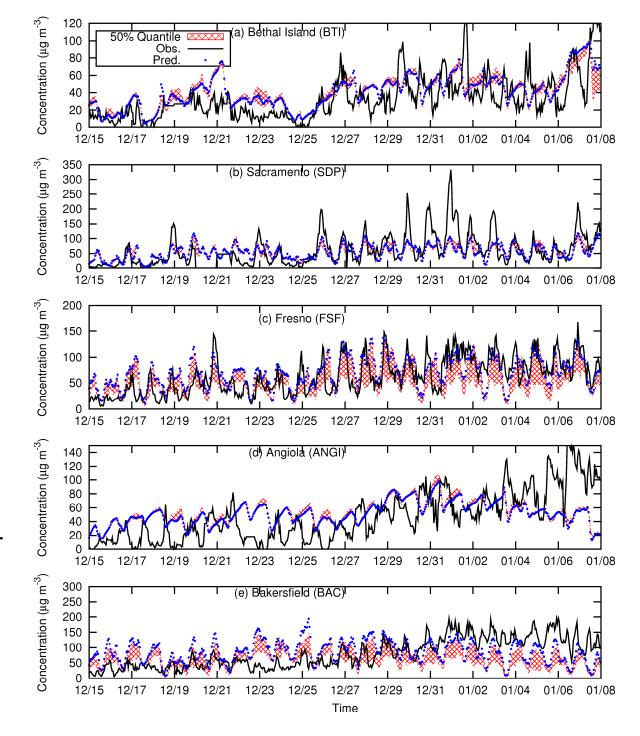
Black Line – measurements

Blue Line – predictions

Red Shading – Mid 50% Quantile within 10km of monitor

Major trends are captured at most stations

Under-prediction of mass at Angiola and Bakersfield near the end of the episode



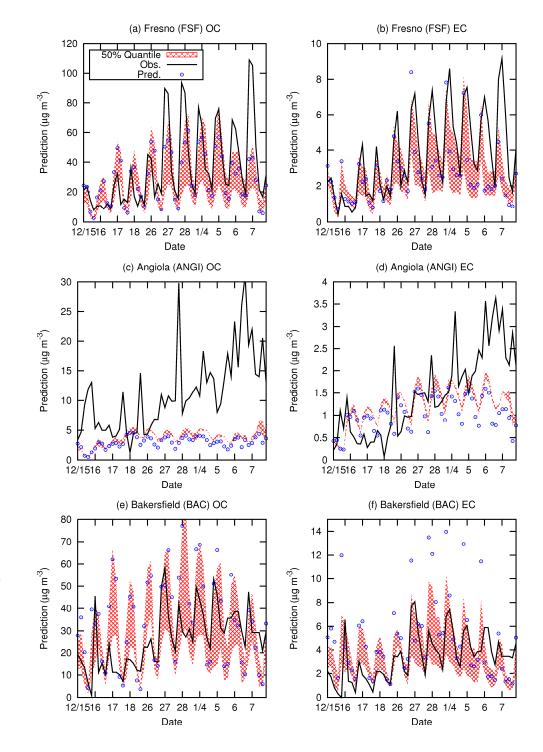
#### PM2.5 OC + EC

Black lines = measurements
Blue circles = predictions
Red Shading – Mid 50% Quantile
within 10km of monitor

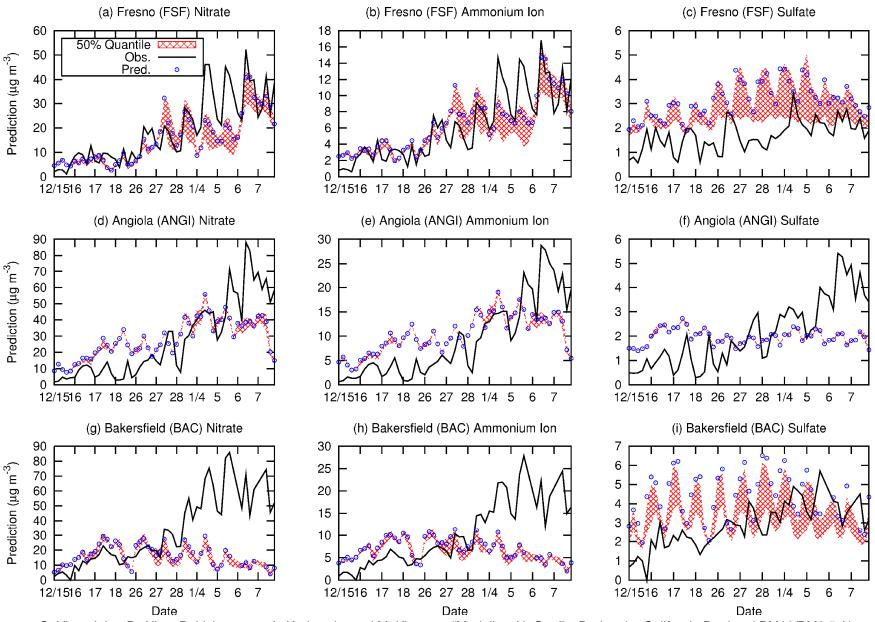
Diurnal pattern predicted correctly at urban sites

Peak values show reasonable agreement, especially considering the sharp gradients

Rural Angiola predictions are low. Where is the EC+OC coming from?

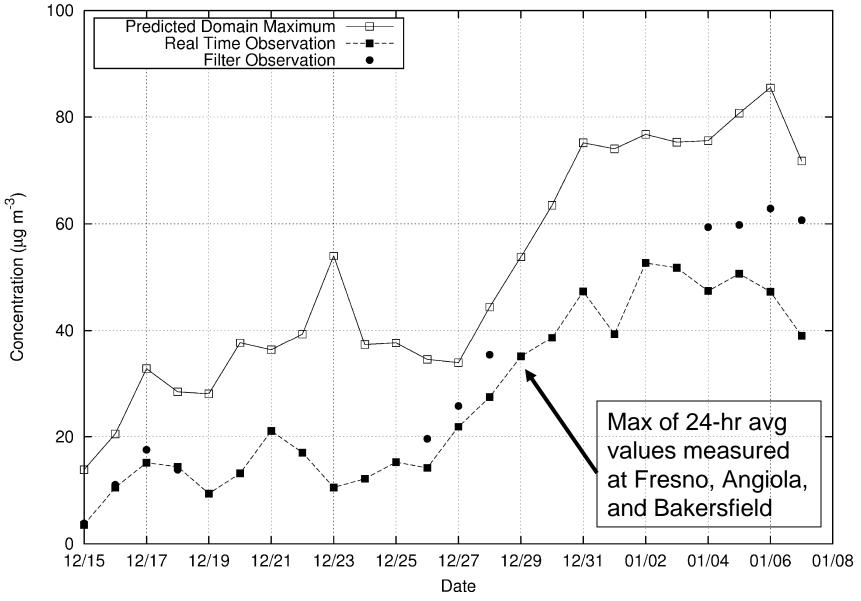


## PM2.5 Nitrate, Ammonium, Sulfate

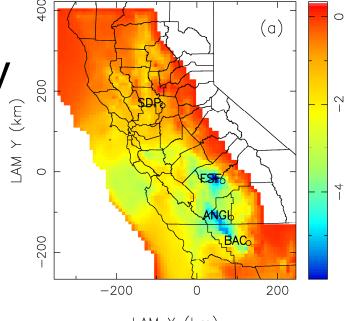


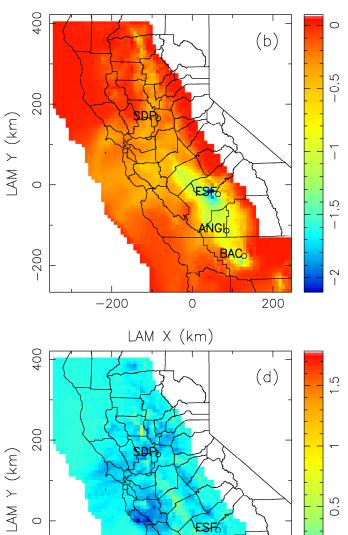
Source: Q. Ying, J. Lu, P. Allen, P. Livingstone, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part I. Base Case Model Results.", Atmos. Env., in press, 2008.

#### Predicted vs. Observed Nitrate Trends

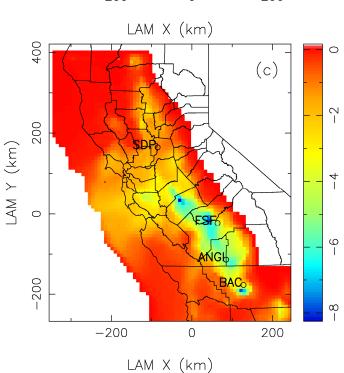


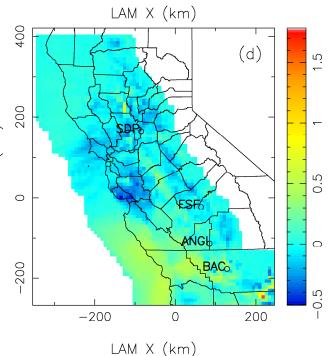
NO3 Sensitivity





Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model - Part III. Regional Source Apportionment of Secondary and Total Airborne PM2.5 and PM0.1.", Atmos. Env., in press, 2008.



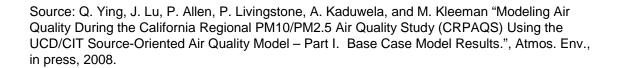


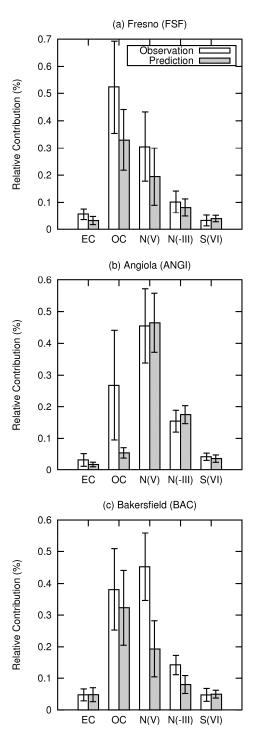
# Relative Component Contributions to PM

Average and standard deviation of predictions and observations is based on 55 samples

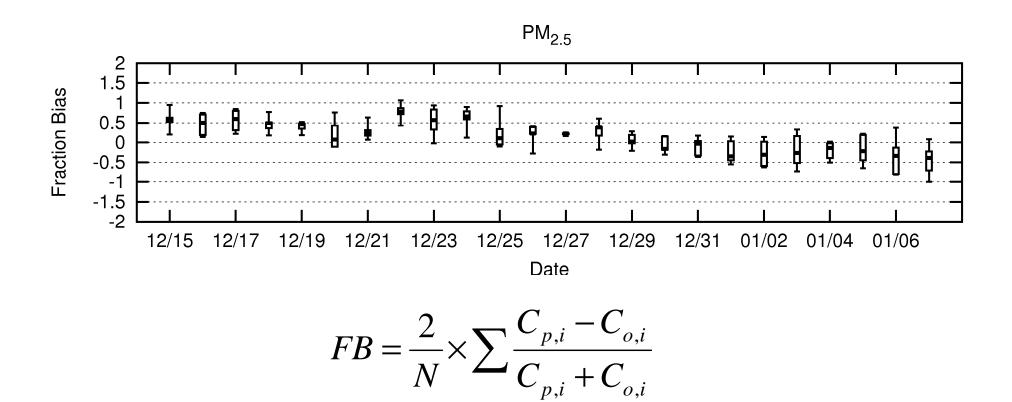
Urban locations (Fresno and Bakersfield)
Predictions and observations match except for
nitrate under-prediction at Bakersfield (discussed
previously)

Rural location (Angiola)
OC under-prediction. What primary sources are we missing? What SOA formation mechanisms are we missing?





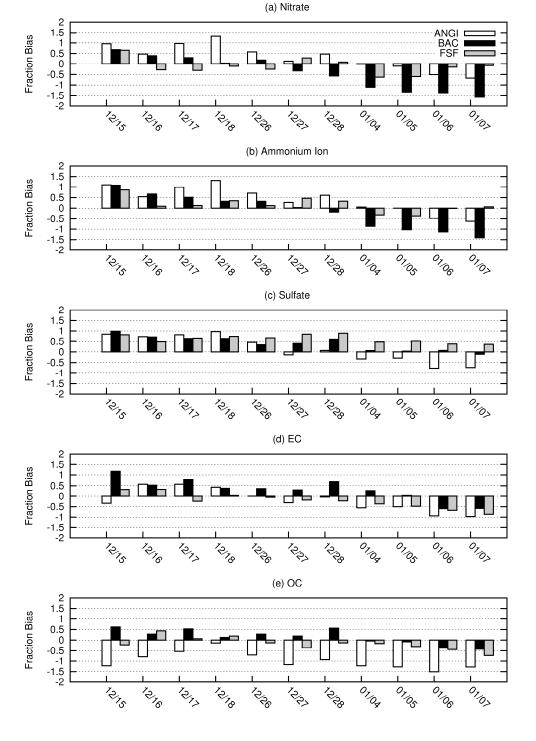
### PM2.5 Fractional Bias



# Fractional Bias of Individual PM2.5 Components

Most components – slight overprediction during early portion of episode evolving to slight underprediction later in episode

OC – always under-predicted at Angiola

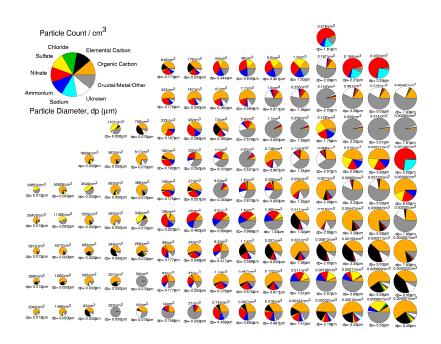


Source: Q. Ying, J. Lu, P. Allen, P. Livingstone, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part I. Base Case Model Results.", Atmos. Env., in press, 2008.

# Source Apportionment Methodology

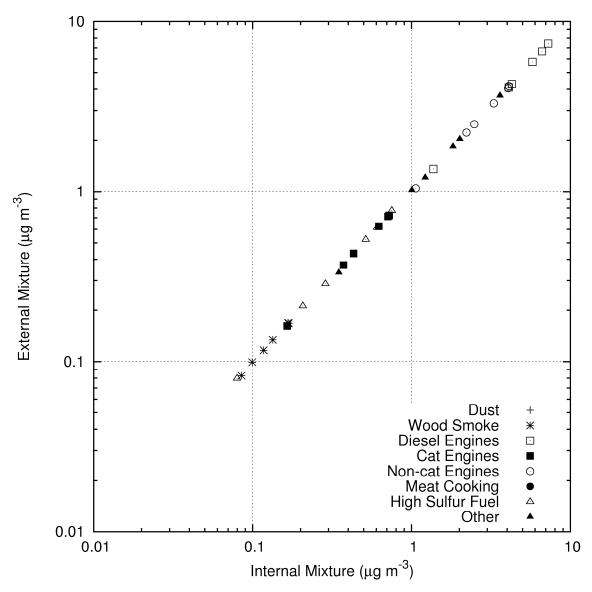
Source-oriented External Mixture

Internal Mixture With Artificial Tracers



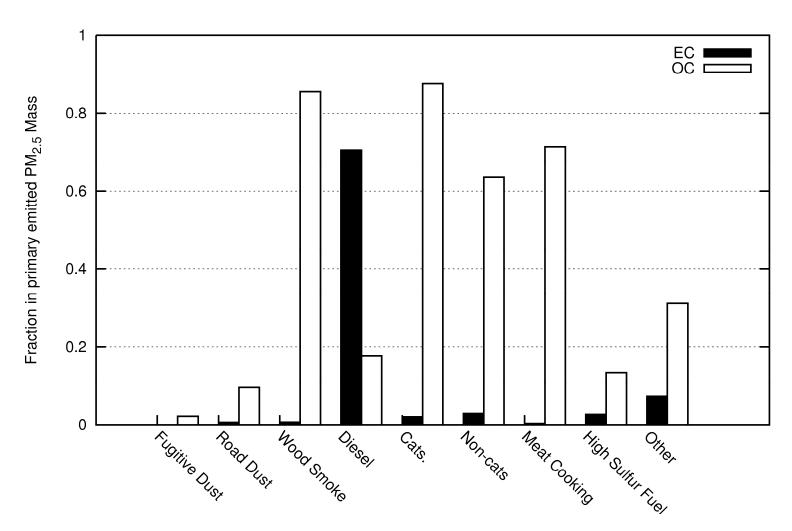


### Internal Vs. External Mixture Comparison



Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part III. Regional Source Apportionment of Secondary and Total Airborne PM2.5 and PM0.1.", Atmos. Env., in press, 2008.

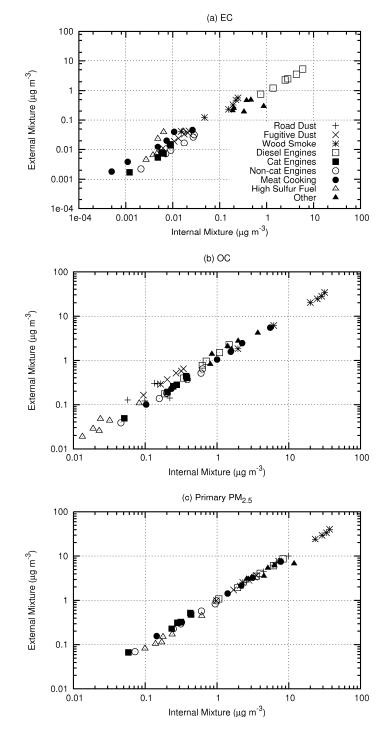
# Averaged PM2.5 EC and OC Fractions For Internally Mixed Source Apportionment



Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part II. Regional Source Apportionment of Primary Airborne Particulate Matter.", Atmos. Env., in press, 2008.

# Internal vs. External Mixture Comparison

Relatively good agreement above 1 µg m<sup>-3</sup>

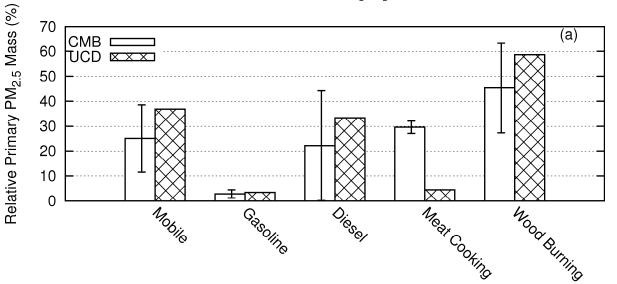


Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part II. Regional Source Apportionment of Primary Airborne Particulate Matter.", Atmos. Env., in press, 2008.

#### Grid Model vs. CMB Source Apportionment

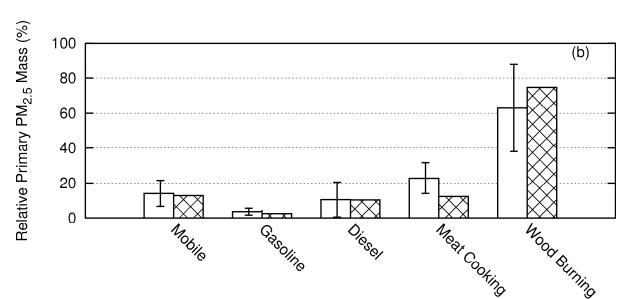


\*\*Dust sources removed from grid model



#### Fresno

\*\*Dust sources removed from grid model

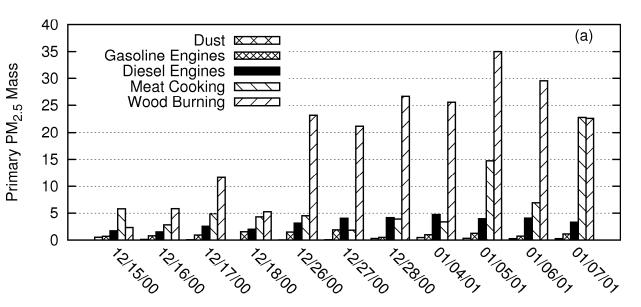


Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part II. Regional Source Apportionment of Primary Airborne Particulate Matter.", Atmos. Env., in press, 2008.

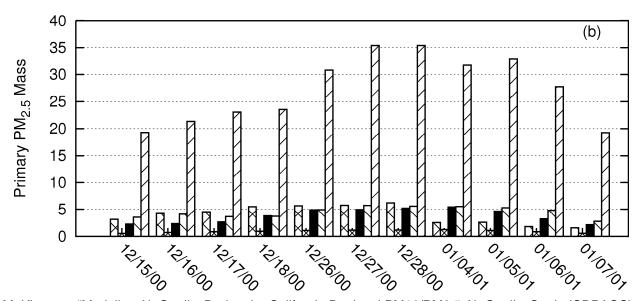
#### Fresno Grid Model vs. CMB Source Apportionment

#### **CMB**

\*\*these results do not match longer averaging time shown on previous slide



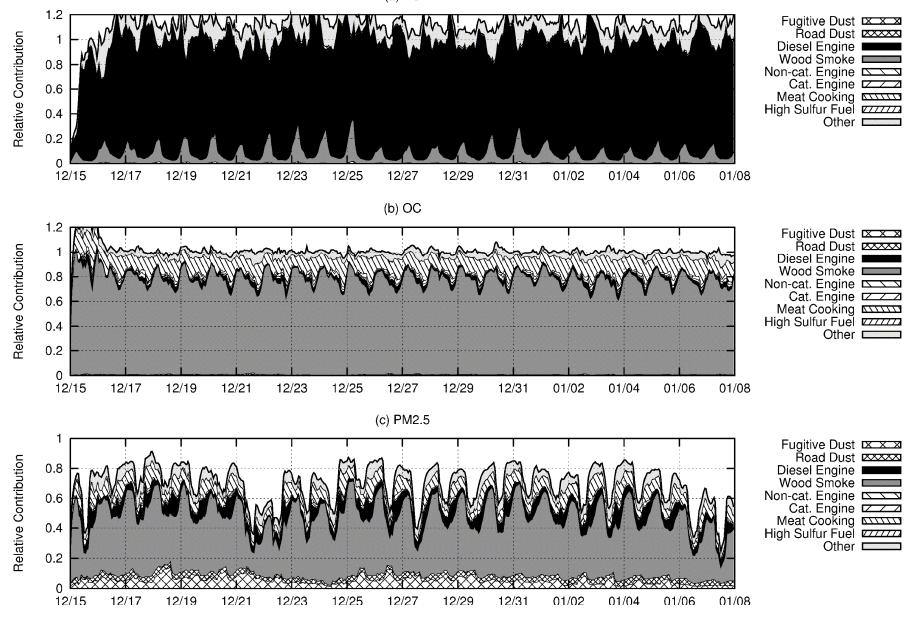
#### **Grid Model**



Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part II. Regional Source Apportionment of Primary Airborne Particulate Matter.", Atmos. Env., in press, 2008.

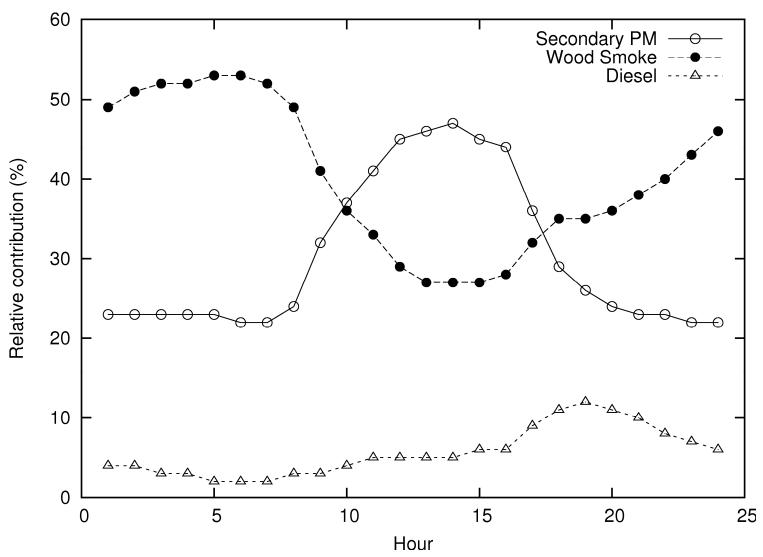
#### Fresno PM2.5 Source Contributions

(a) EC



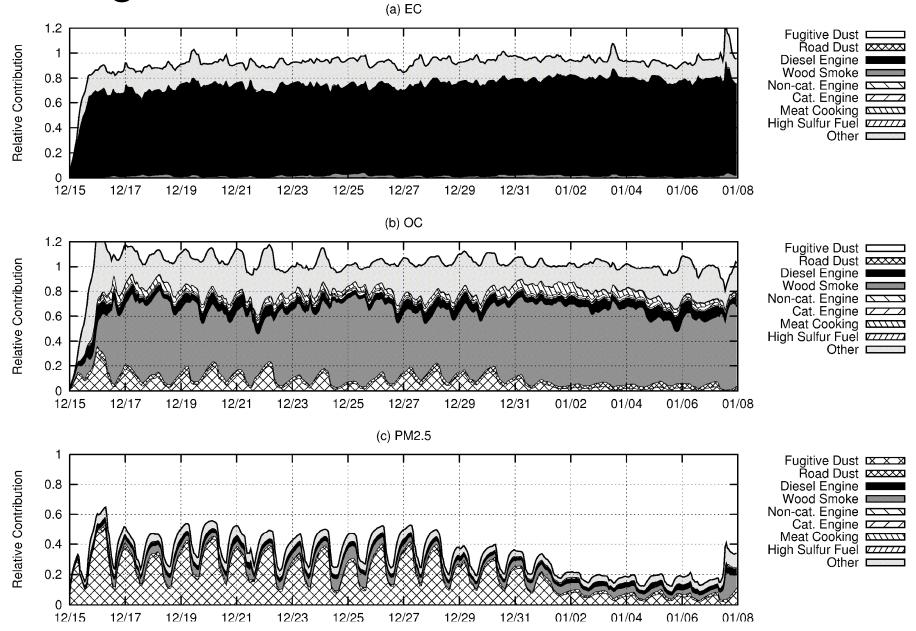
Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part II. Regional Source Apportionment of Primary Airborne Particulate Matter.", Atmos. Env., in press, 2008.

# Average Diurnal Variation of Source Contributions



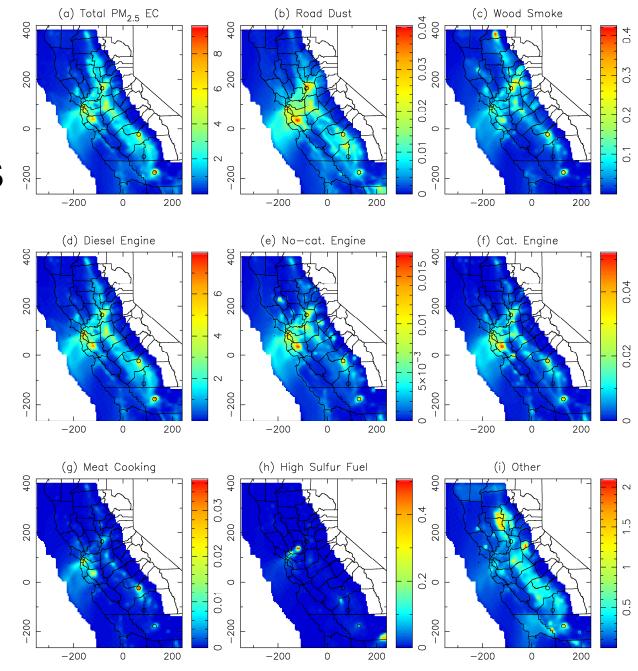
Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part II. Regional Source Apportionment of Primary Airborne Particulate Matter.", Atmos. Env., in press, 2008.

### Angiola PM2.5 Source Contributions



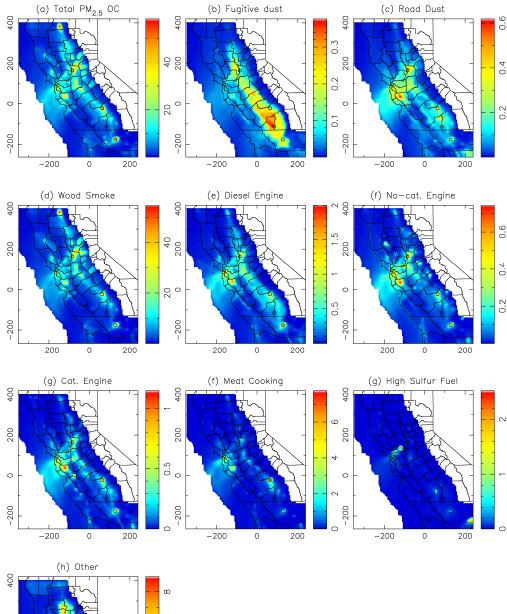
Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part II. Regional Source Apportionment of Primary Airborne Particulate Matter.", Atmos. Env., in press, 2008.

# Regional EC Source Contributions

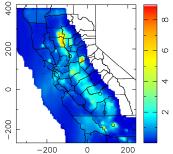


Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part II. Regional Source Apportionment of Primary Airborne Particulate Matter.", Atmos. Env., in press, 2008.

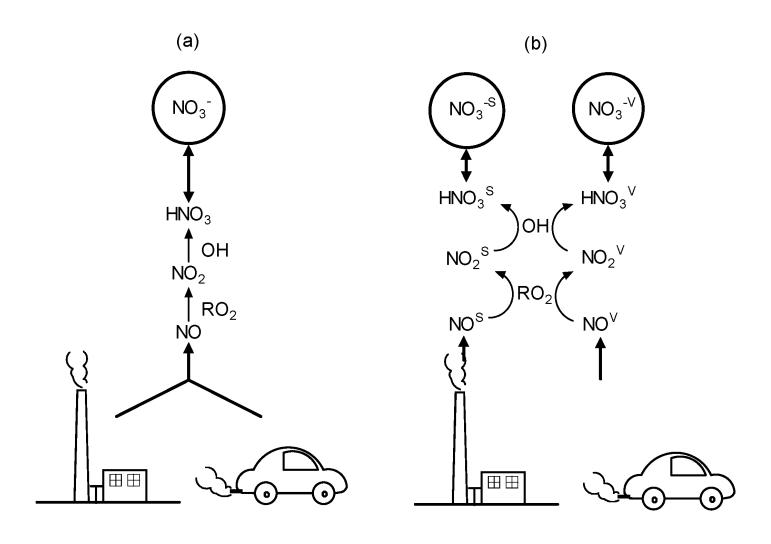
# Regional OC Source Contributions



Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part II. Regional Source Apportionment of Primary Airborne Particulate Matter.", Atmos. Env., in press, 2008.

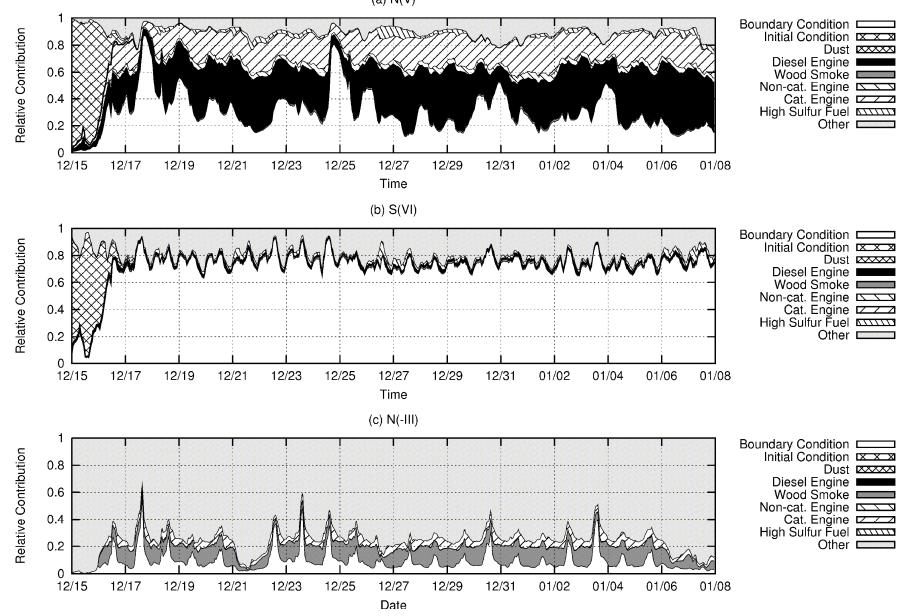


# Source Apportionment of Secondary PM



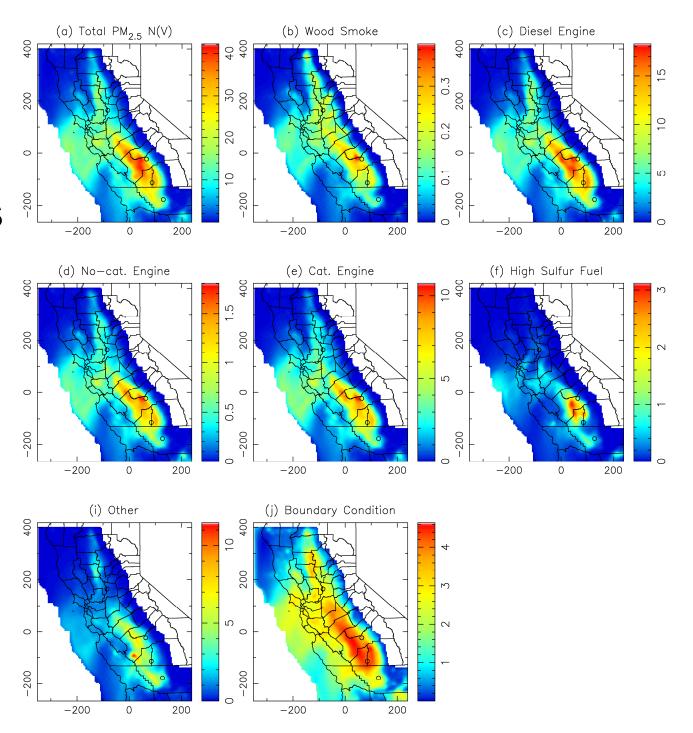
Source: Ying, Q. and M.J. Kleeman. "Source contributions to the regional distribution of secondary particulate matter in California." Atmospheric Environment, Vol 40, pp 736-752, 2006.

# Fresno Source Contributions

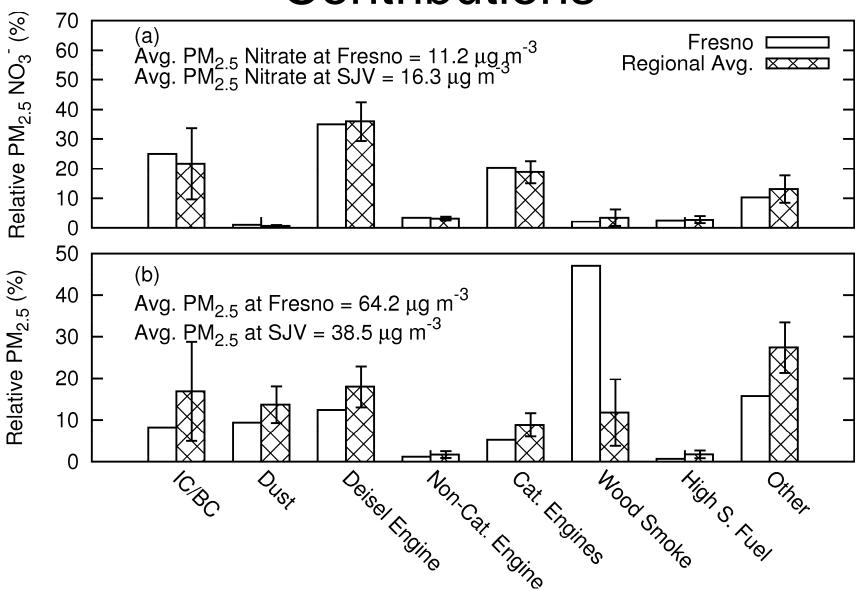


Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part III. Regional Source Apportionment of Secondary and Total Airborne PM2.5 and PM0.1.", Atmos. Env., in press, 2008.

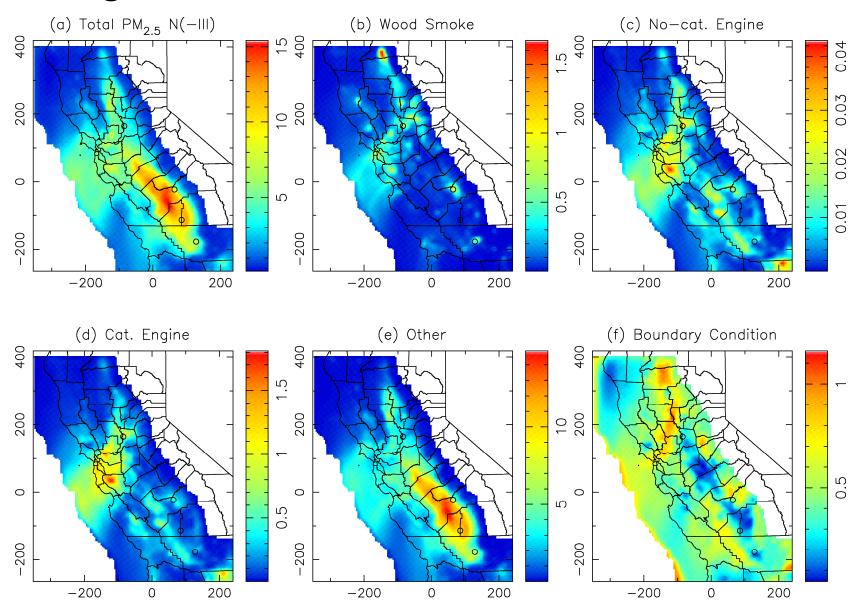
# Regional Nitrate Source Contributions



# Fresno vs. Region-wide Source Contributions

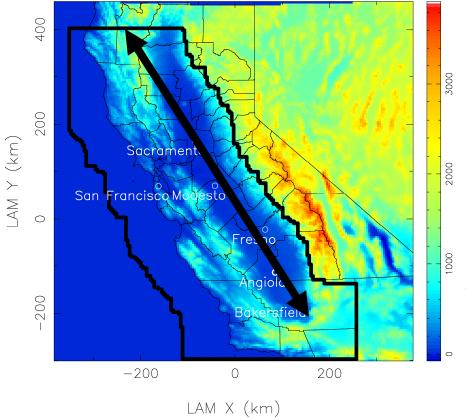


## Regional NH4+ Source Contributions

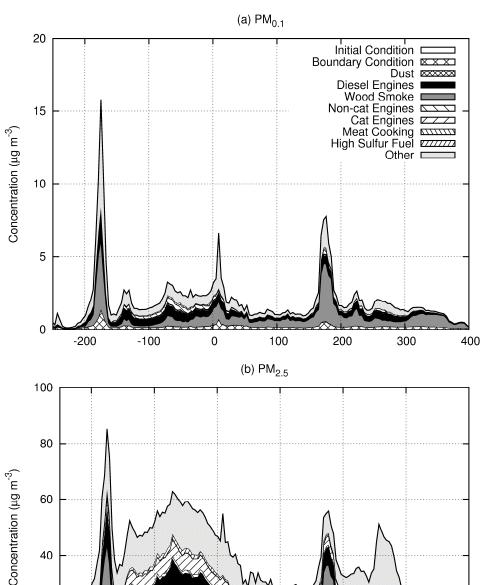


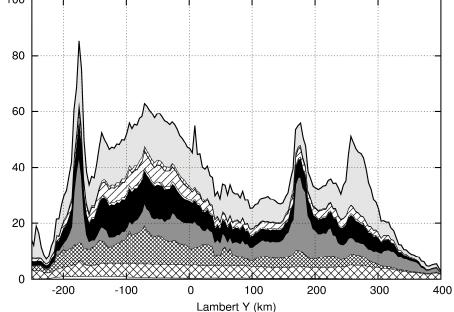
Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part III. Regional Source Apportionment of Secondary and Total Airborne PM2.5 and PM0.1.", Atmos. Env., in press, 2008.

# **PM Spatial** Gradients

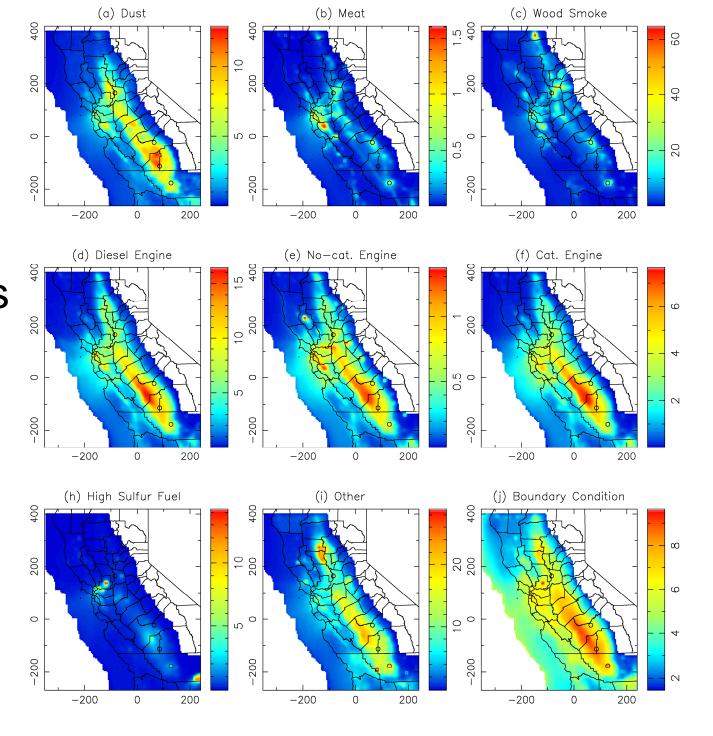


Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model -Part III. Regional Source Apportionment of Secondary and Total Airborne PM2.5 and PM0.1.", Atmos. Env., in press, 2008.





Regional
PM2.5
(primary +
secondary)
Source
Contributions



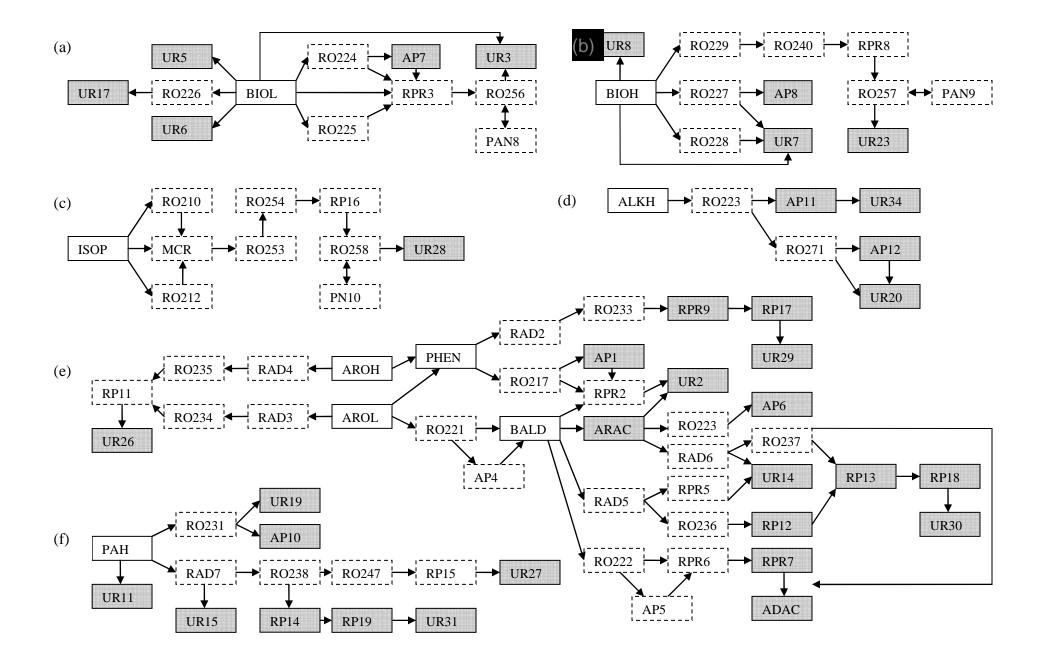
Source: Q. Ying, J. Lu, A. Kaduwela, and M. Kleeman "Modeling Air Quality During the California Regional PM10/PM2.5 Air Quality Study (CRPAQS) Using the UCD/CIT Source-Oriented Air Quality Model – Part III. Regional Source Apportionment of Secondary and Total Airborne PM2.5 and PM0.1.", Atmos. Env., in press, 2008.

# **SOA Source Apportionment**

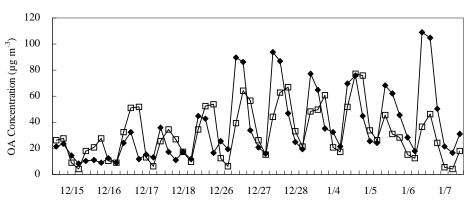
 Same techniques used for nitrate source apportionment can also be applied to SOA

# Caltech Atmospheric Chemistry Mechanism (CACM)

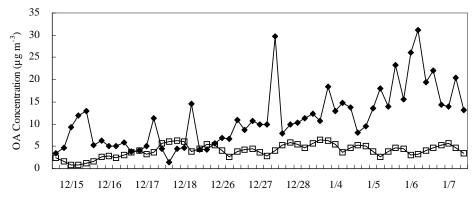
- Designed to simulate O3 and SOA formation
  - 210 species
  - 421 reactions
- Modifications for source apportionment of SOA
  - 1027 species
  - 2038 reactions



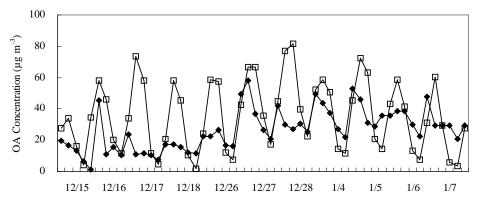
# Predicted (open squares) and Observed OC (solid diamonds) using CACM



#### a.) Fresno

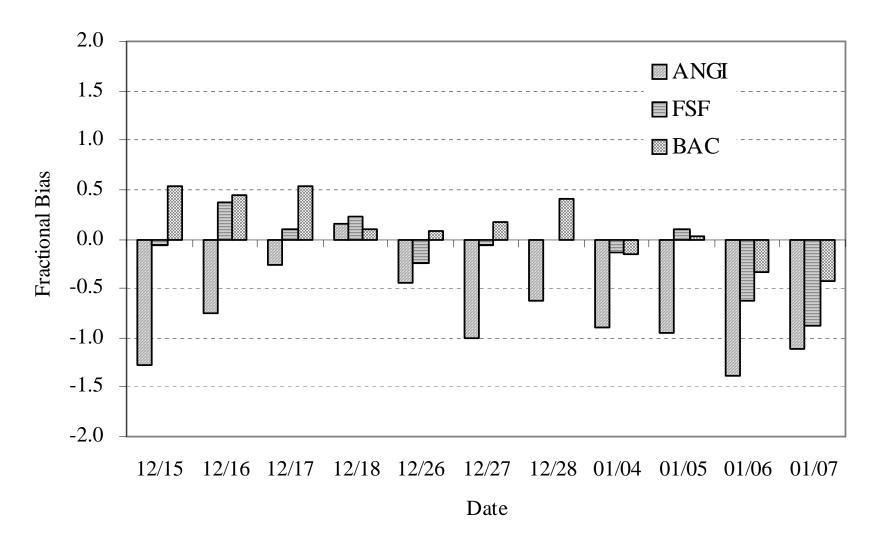


#### b.) Angiola



#### c.) Bakersfield

# OA Fractional Bias Using CACM



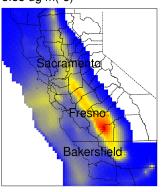
#### **SOA** contributions from selected chemical surrogate species

S1: Low Carbon Carboxylic Acids 0.02 ug m(-3)Bakersfield.

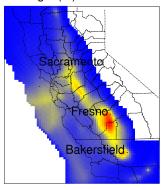
S5: Biogenic, Non-dissociative 1.55 ug m(-3)



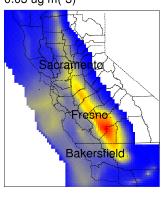
S9: High SOA Yield Alkane-derived 3.85 ug m(-3)



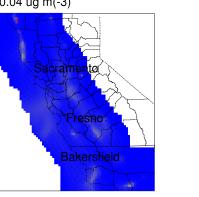
S2: Aromatic Fragments, Dissociative S4: Biogenic, Dissociative 0.27 ug m(-3)



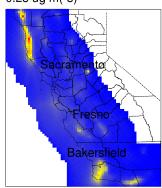
S6: Aromatic, High Volatility 0.03 ug m(-3)



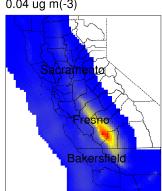
S10: Biogenic, Ring-retaining 0.04 ug m(-3)

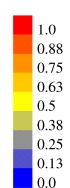


0.23 ug m(-3)

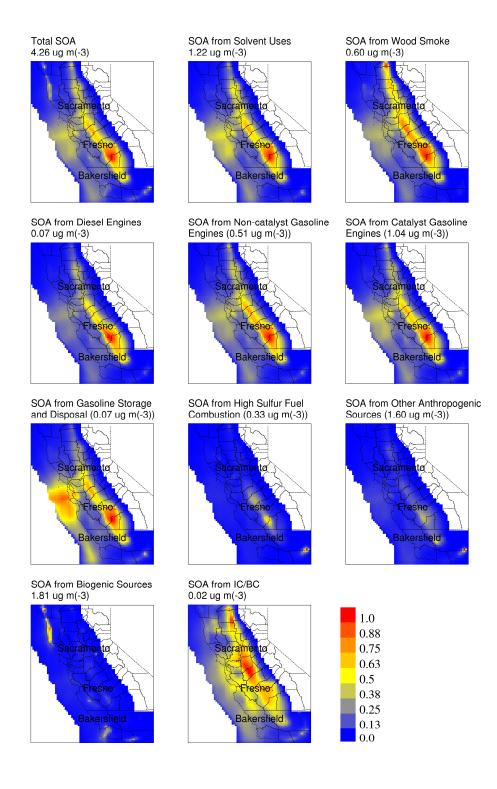


S7: Aromatic, Low Volatility 0.04 ug m(-3)

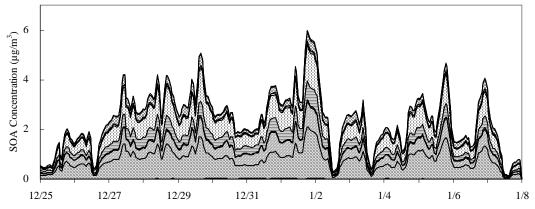




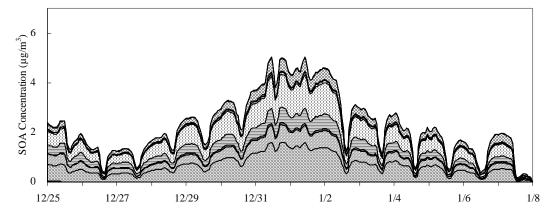
Predicted SOA Source Contributions Using CACM December 25, 2000 and January 7, 2001.



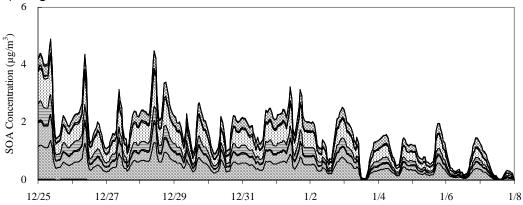
#### **SOA Source Contributions**



#### a.) Fresno







#### c.) Bakersfied

#### ⊞ IC/BC

■ Wood Smoke

 $\blacksquare$  Non-catalyst Gasoline Engines

☐ Gasoline Storage and Disposal

☑ Other Anthropogenic

■ Solvent Use

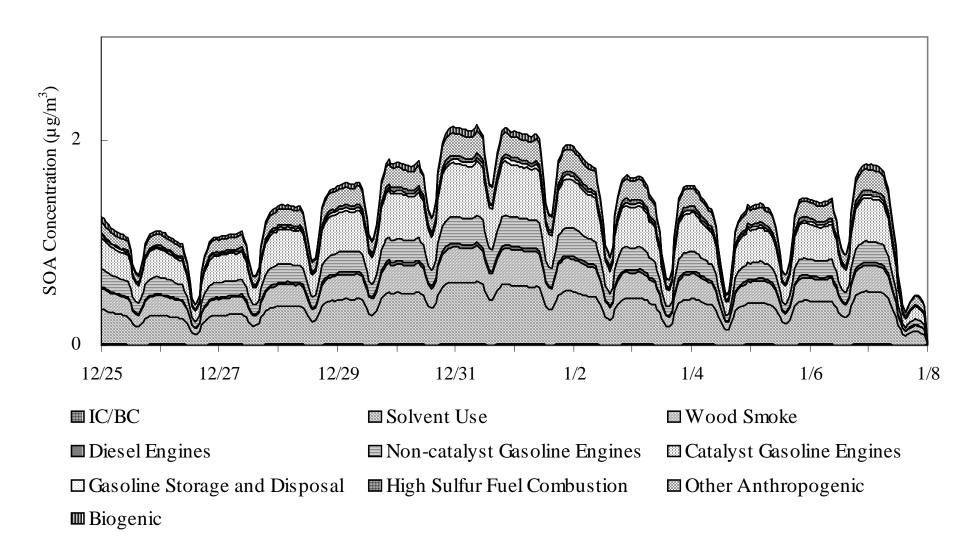
■ Diesel Engines

☐ Gasoline Engines

■ High Sulfur Fuel Combustion

Biogenic

# SJV Average SOA Source Contributions



#### **SOA Diurnal Variation** December 25, 2000 and January 7, 2001.

■ Solvent Use ■ Diesel Engines

Biogenic

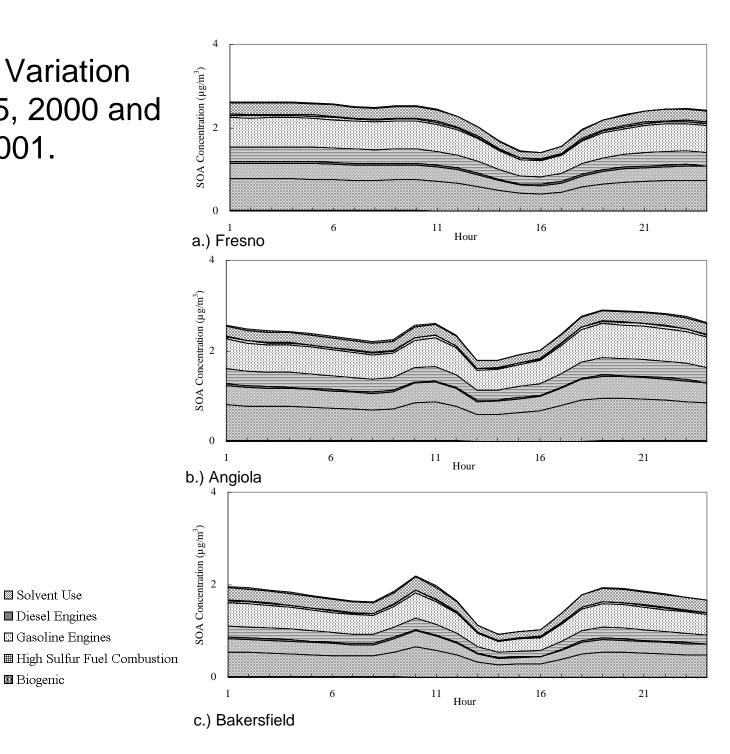
□ Gasoline Engines

■ IC/BC

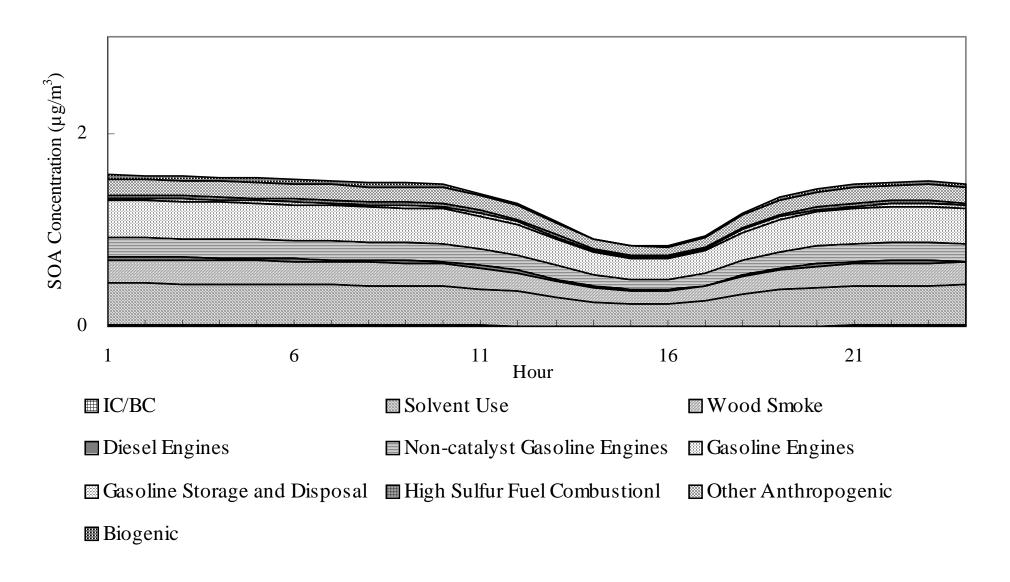
■ Wood Smoke

■ Non-catalyst Gasoline Engines

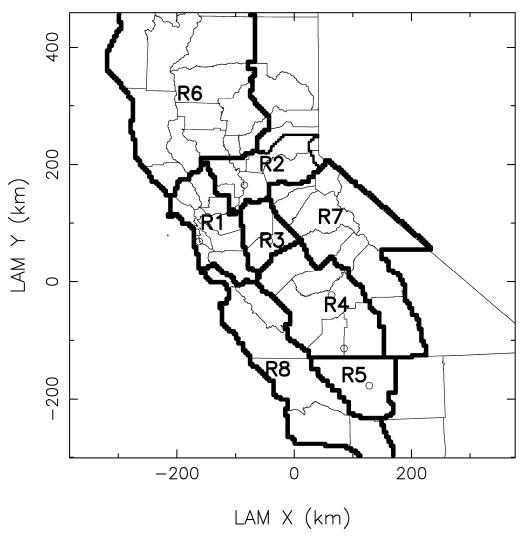
☑ Other Anthropogenic



# SJV Average SOA Diurnal Variation

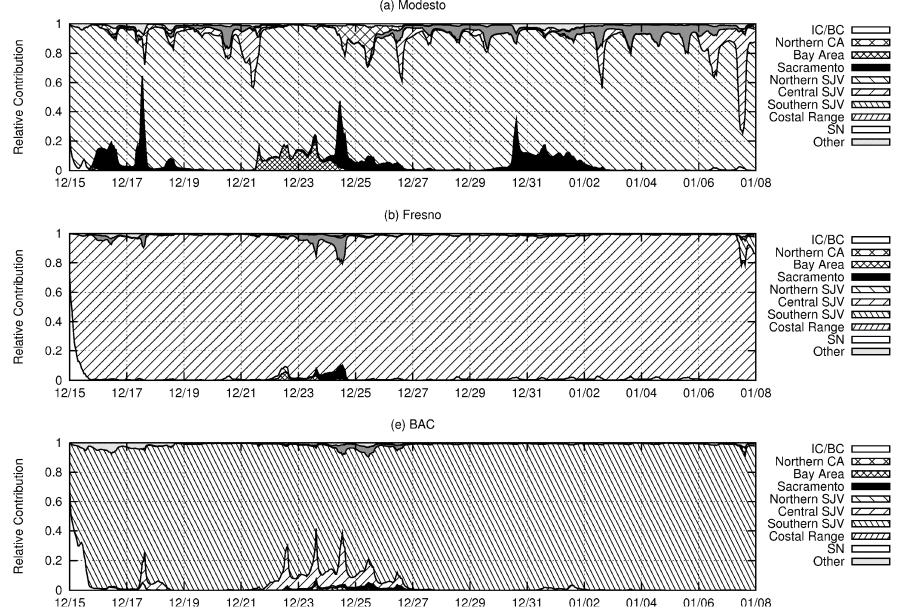


# How Much PM Does Each Region Contribute to Other Regions?



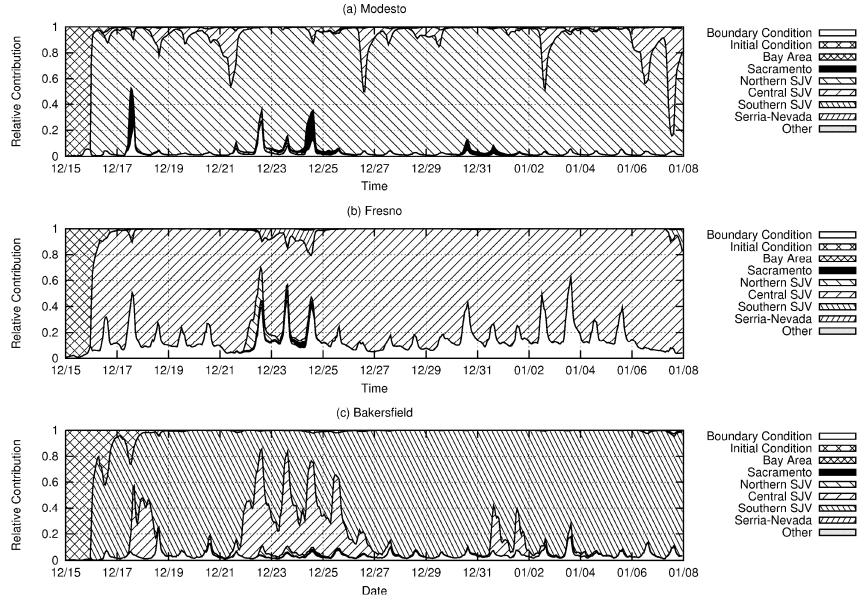
Source: Q. Ying, and M. Kleeman "Regional Contributions to Airborne Particulate Matter in Central California During a Severe Pollution Episode", Atmos. Env., submitted for publication, 2008.

# OC Region Contributions



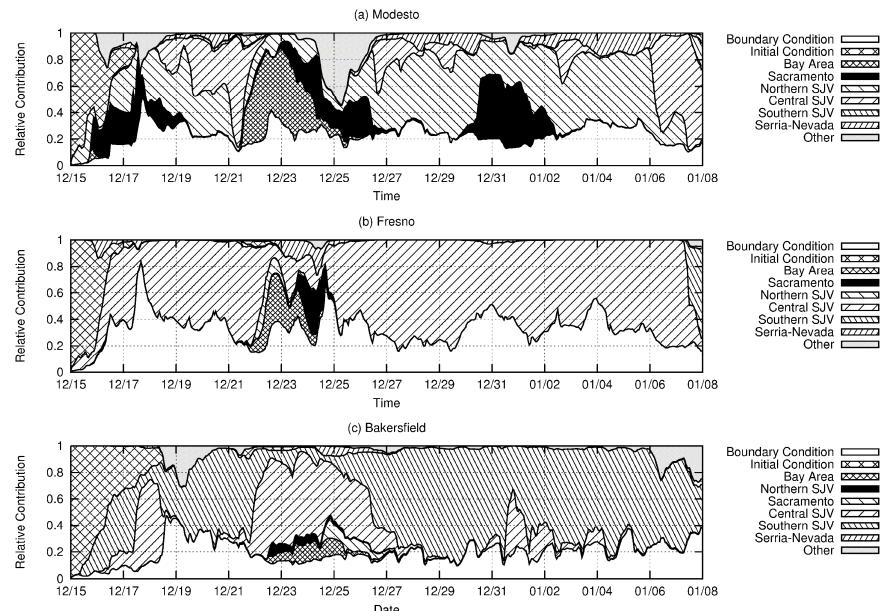
Source: Q. Ying, and M. Kleeman "Regional Contributions to Airborne Particulate Matter in Central California During a Severe Pollution Episode", Atmos. Env., submitted for publication, 2008.

# NH<sub>4</sub><sup>+</sup> Region Contributions



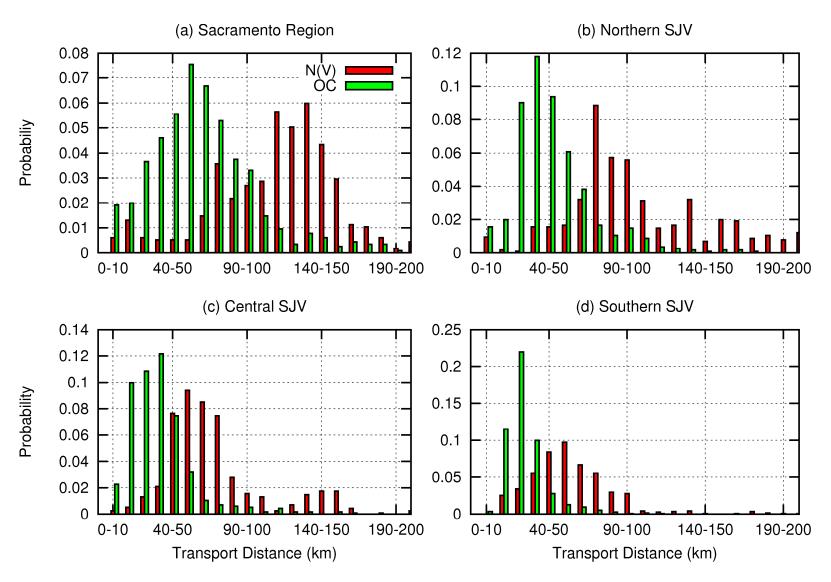
Source: Q. Ying, and M. Kleeman "Regional Contributions to Airborne Particulate Matter in Central California During a Severe Pollution Episode", Atmos. Env., submitted for publication, 2008.

# NO<sub>3</sub>- Region Contributions



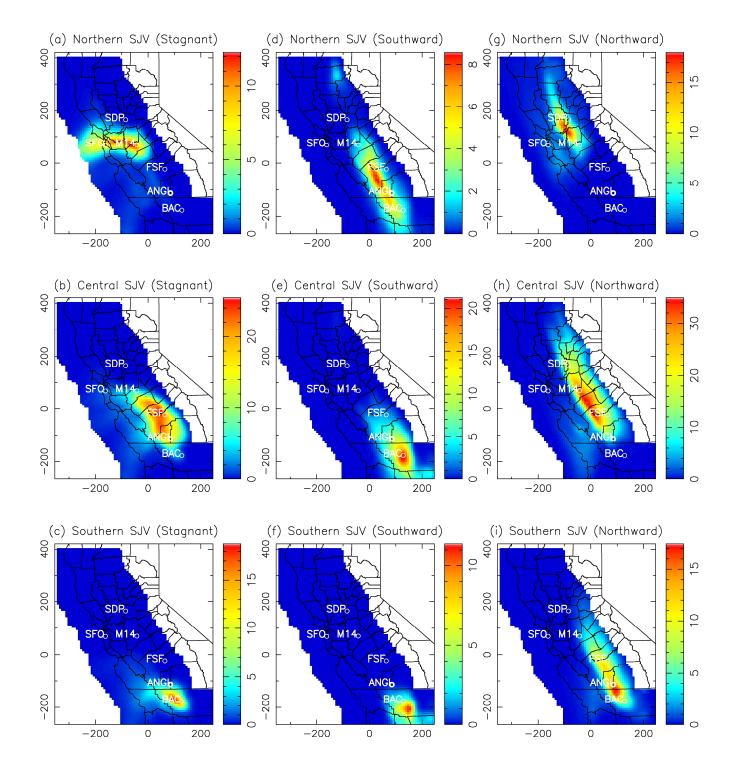
Source: Q. Ying, and M. Kleeman "Regional Contributions to Airborne Particulate Matter in Central California During a Severe Pollution Episode", Atmos. Env., submitted for publication, 2008.

# Distribution of Transport Distances



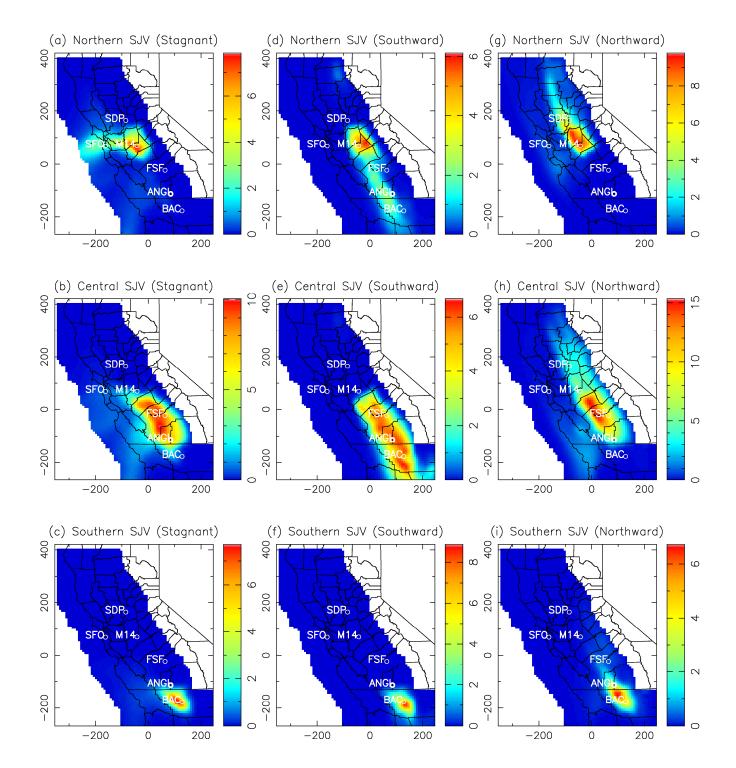
Source: Q. Ying, and M. Kleeman "Regional Contributions to Airborne Particulate Matter in Central California During a Severe Pollution Episode", Atmos. Env., submitted for publication, 2008.

# PM2.5 NO3-



Source: Q. Ying, and M. Kleeman "Regional Contributions to Airborne Particulate Matter in Central California During a Severe Pollution Episode", Atmos. Env., submitted for publication, 2008.

# PM2.5 NH4+



Source: Q. Ying, and M. Kleeman "Regional Contributions to Airborne Particulate Matter in Central California During a Severe Pollution Episode", Atmos. Env., submitted for publication, 2008.

# Regional Contribution Summary

Table 1
24-hour averaged PM<sub>2.5</sub> nitrate contribution from each source sub-region (Sx) to other receptor sub-regions (Rx). Figure 1 shows region designations: 0=boundary conditions; 1=Bay Area; 2=Sacramento; 3=northern SJV; 4=central SJV; 5=southern SJV; 6=northern Sacramento Valley; 7=Sierra Mountains; 8=Other.

	<b>S</b> 0	S1	S2	S3	S4	S5	S6	<b>S</b> 7	<b>S</b> 8	$\operatorname{SUM}$
R1	2.1%	1.5%	1.8%	1.4%	0.4%	0.0%	0.2%	0.2%	0.7%	8.2%
R2	1.1%	0.2%	1.3%	0.3%	0.3%	0.0%	0.1%	0.1%	0.8%	4.3%
R3	1.3%	0.3%	0.8%	1.7%	1.0%	0.0%	0.1%	0.4%	0.2%	5.9%
R4	5.0%	0.8%	0.9%	1.7%	17.7%	0.7%	0.8%	0.4%	0.3%	28.3%
R5	1.4%	0.3%	0.2%	0.2%	3.1%	3.1%	0.4%	0.0%	0.2%	9.0%
R6	3.4%	1.1%	0.6%	1.1%	4.0%	1.4%	2.0%	0.1%	0.7%	14.5%
R7	0.5%	0.1%	0.1%	0.1%	0.3%	0.0%	0.1%	0.2%	0.0%	1.5%
R8	8.4%	3.9%	2.3%	1.7%	2.4%	0.6%	2.3%	0.2%	6.5%	28.4%
SUM	23.2%	8.2%	8.1%	8.2%	29.3%	6.0%	6.0%	1.6%	9.4%	100.0%

Source: Q. Ying, and M. Kleeman "Regional Contributions to Airborne Particulate Matter in Central California During a Severe Pollution Episode", Atmos. Env., submitted for publication, 2008.

### Conclusions

- Basecase model performance using diagnostic meteorology captures major pollutant trends
- Mechanistic primary source apportionment (grid model) agrees well with CMB results
- Source contributions to primary PM
  - Wood smoke at urban locations
- Source contributions to secondary nitrate
  - Diesel engines contribute most of the NOx
  - Gasoline engines also significant

### Conclusions

- Primary and secondary PM concentrations are dominated by local sources
- Transport distance for Nitrate > Ammonium Ion > Organic Carbon
- Transport between regions seems relatively low during CRPAQS stagnant conditions
  - Material mixed to upper layers is quickly transported out of the domain.

### Conclusions

- SOA can account for a significant fraction of the OC at rural locations
  - Solvent use is a dominant source

### **Future Work**

Visibility Source Apportionment

- Compare particle mixing state and composition to ATOFMS single particle measurements
  - Requires that we simulate the Feb episode (IOP4) because this is the only useful ATOFMS data

# Supporting Slides

# Secondary Organic Aerosol Mechanism (SOAM)

- SAPRC90 mechanism with enhancements to describe formation of condensable organics
  - 126 species
  - 208 reactions
- Modifications for source apportionment of NO<sub>3</sub><sup>-</sup>, SO<sub>4</sub><sup>2-</sup>, and NH<sub>4</sub><sup>+</sup>
  - 298 species
  - 1261 reactions

